## LAr TPC data reconstruction

Dorota Stefan
CERN/NCBJ Warsaw Poland

BNL Seminar 11.5.2015

#### **Outline**

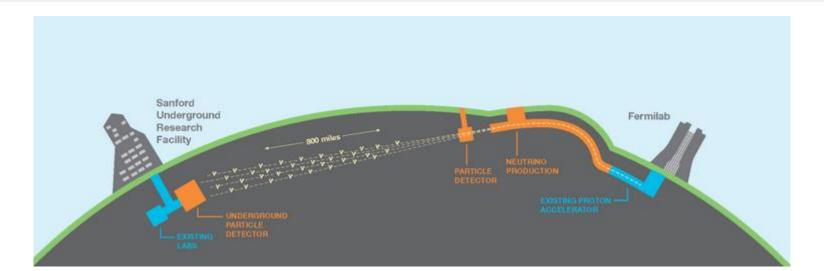
- Introduction: Liquid Argon TPC's and reconstruction challenges in these detectors.
- Chain of LAr TPC data processing, closer look at new approaches designed for ICARUS experiment which are now continued for application in next LAr TPC projects.
- Examples of applications in ICARUS, 35t and protoDUNE.
- Summary.

#### **Physics in DUNE**

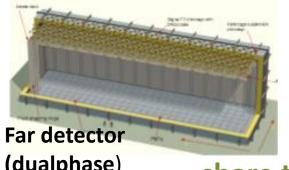
#### **DUNE**

Deep Undeground Neutrino Experiment

- CP symmetry violation in neutrino interactions.
- Neutrino mass ordering.
- Neutrino oscillation parameters.
- Nucleon decay.
- Neutrino bursts from supernova.



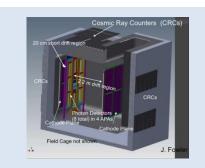
## **Experiments with LArTPC**



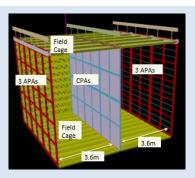


(dualphase)

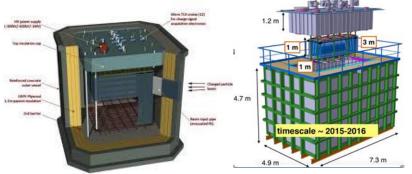
## share the same design principles



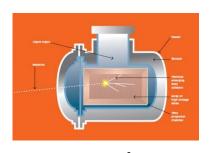
35t prototype



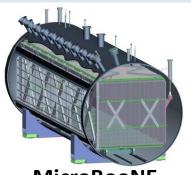
protoDUNE



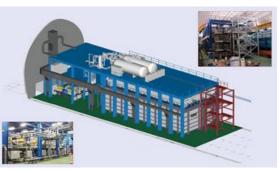
dual-phase WA105 prototypes



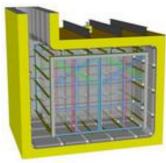
**ArgoNeuT/LArIAT** 



**MicroBooNE** 

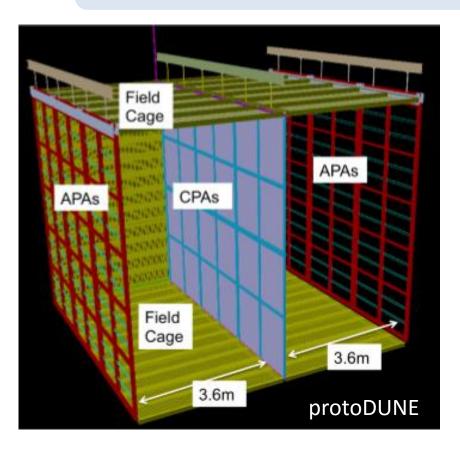


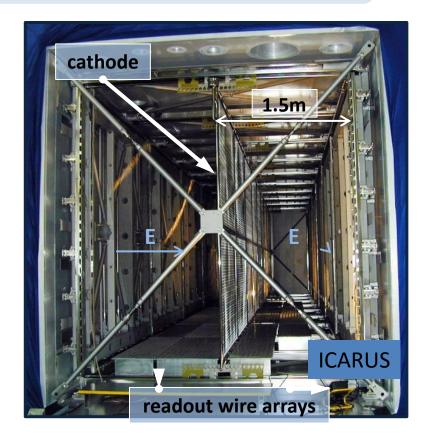
**ICARUS** 



**SBND** 

#### **LArTPC** detectors - different designs





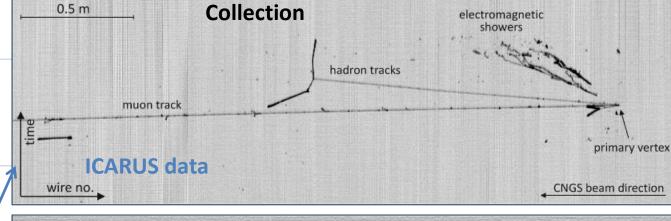
- Modularized anodes (2m x 6m) vs single anode (4m x 20m).
- 5 mm wire pitch vs 3 mm wire pitch.
- Wire orientation.
- Number of readout wire planes (3 or only 2).
- And many more differences...

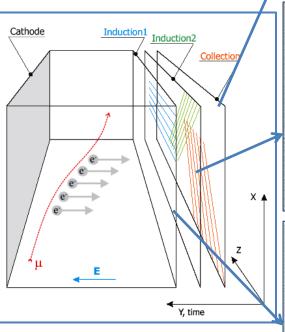


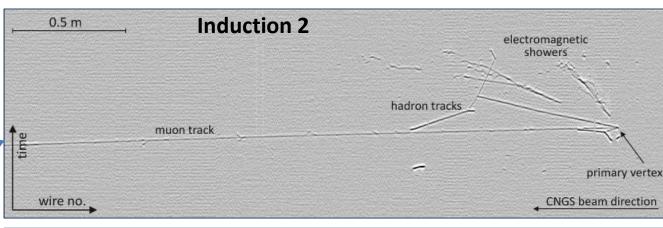
## **LArTPC** principles

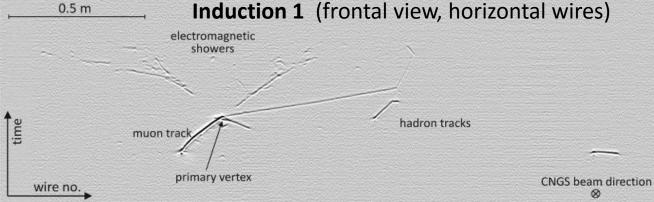
0.5 m

An example of  $\nu_{\mu}$  charge current interaction, one of TPC's shown









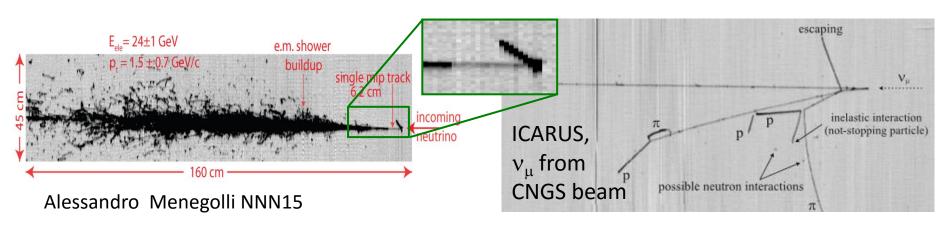
#### Aims of reconstruction

- Enable physics analysis: CP violation in neutrino flavor mixing, nucleon decay, neutrinos from supernovae, searches for sterile neutrino...
- We have to identify incident particle ( $v_e$ ,  $v_\mu$ , nucleon decay, muon...) and measure momenta.
- How?
  - Find primary vertex
  - Identify outgoing particles
  - Measure their momenta



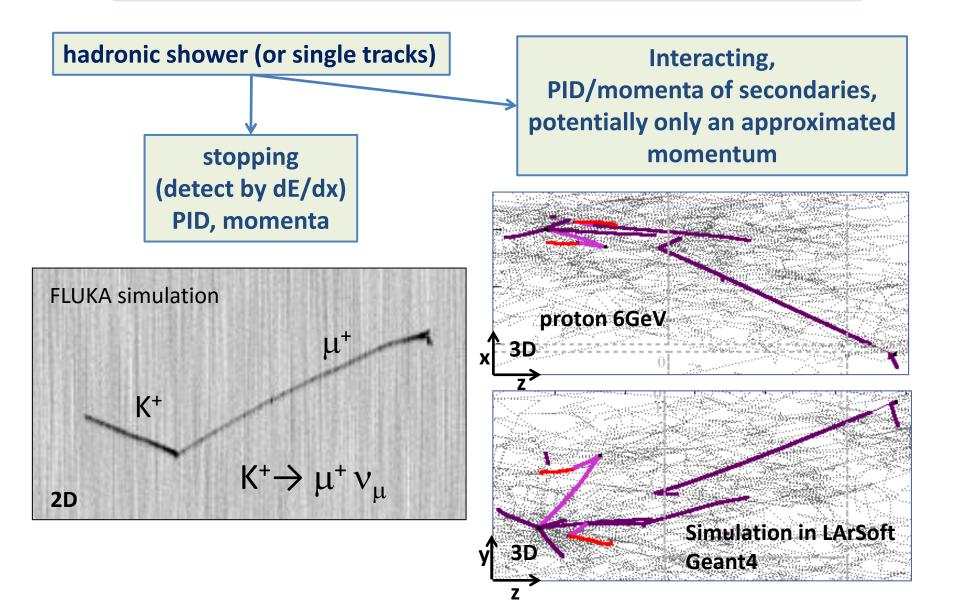
#### What should we expect in data?

- There are usually EM showers and tracks, they need different treatment.
  - detailed trajectories of tracks needed for correct reonstruction/analysis
  - details of the initial direction and <u>complete</u> energy of EM shower
- There are various difficult topologies to be reconstructed and LArTPC is all about non-uniformities in every possible aspects.
- Ideally would be to have a general tool: reconstructs neutrino events, nucleon decay, cosmics...



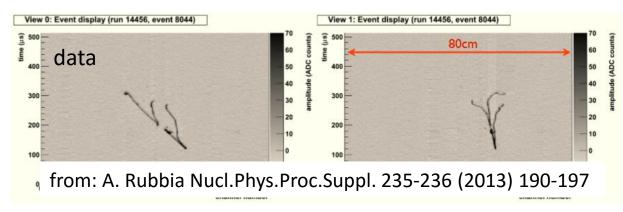
From European Strategy for Neutrino
Oscillation Physics – II, poster, Cern 2012

## Hadronic shower and track topologes

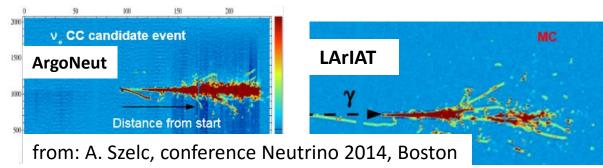


#### **Electromagnetic showers**

 low energy cascade

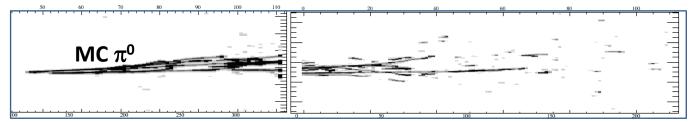


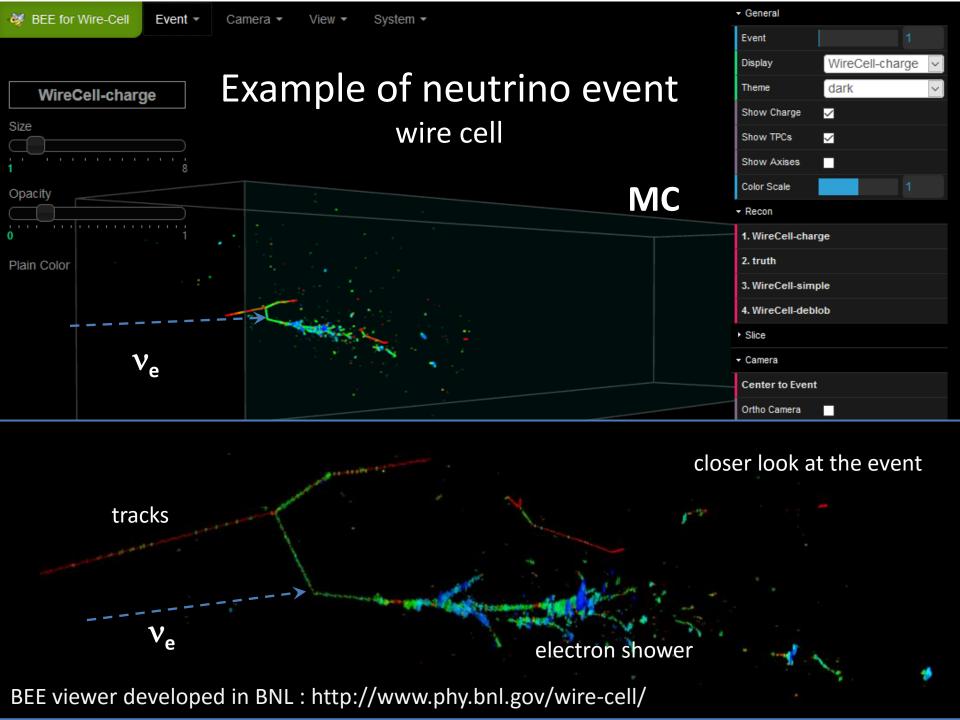
fully developped cascade



multiple showers

simulated  $\pi^0$  with energy ~ 1 GeV in LArSoft





#### Non-uniformities in LArTPC

- Direction-dependent resolution:
   wire spacing differs from signal sampling rate.
- Signals of tracks parallel to the electric field.
- Signal attenuation:
  - LAr impurities,
  - recombination effect can have angular dependance.
- Diffusion.
- Space charge effects.
- We have to be prepared for usual hardware failures.

#### Spatial reconstruction – why is it so difficult?

- wire views: 3D structure in "stereoscopic" 2D projections taken at different angles.
  - event looks very different in each projection (rotation)
  - very likely there will be something difficult in each projection: overlapping, running in the wire direction, "horizontal", missing, ...
- Little help for reconstruction from external detectors
   approximate location / ID with PMTs, in general whole event details to be
   reconstructed from TPC data solely.
- wire signal characteristics may be different in each plane.

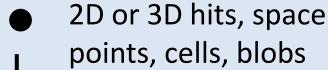
Results can depend on:

- Wire pitch
- Wire orientation
- Wrapped wires
- Number of readout wire planes
- Screening plane
- Detector division into many TPCs
- Detector orientation w.r.t. beam line
- ...plus LArTPC non-uniformities

#### **Reconstruction chain**



#### DATA



clusters: track like, shower like objects

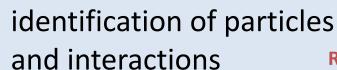
PATTERN RECOGNITION



#### trajectory, vertices

FIT

- Use 3D space points from preceding stage: refit reduced information
- Or look at 2D data selected by clustering: fit directly to measurement



HIGH LEVEL PATTERN RECOGNITION

- DBSCAN
- Fuzzy Clustering
- Charge distribution matching
- Clustercrawler/C
   CTrackMaker
- Hough transform
- Cellular automaton
- Kalman Filter
- Bezier Tracking
- Principle Curves
- Polygonal Line

hits, space points, cells, blobs

clusters: track like, shower like objects

#### trajectory, vertices

- Use 3D space points from preceding stage: refit reduced information
- Or look at 2D data selected by clustering: fit directly to measurement

identification of particles and interactions

# 2D clusters reconstruction in ICARUS – event segmentation

#### 1. Hits $\Rightarrow$ strictly linear segments

Basic requirement for the segment:

- hit positions on line;
- hits touching each other

#### **Result:**

- clusters that do not mix hits from different objects
- usually large number of small clusters;

(long straight tracks are also accepted, if found at this stage)

algorithm starts from external parts of the event towards its primary vertex



#### 2. Segments merging

Grow track segments by merging based on:

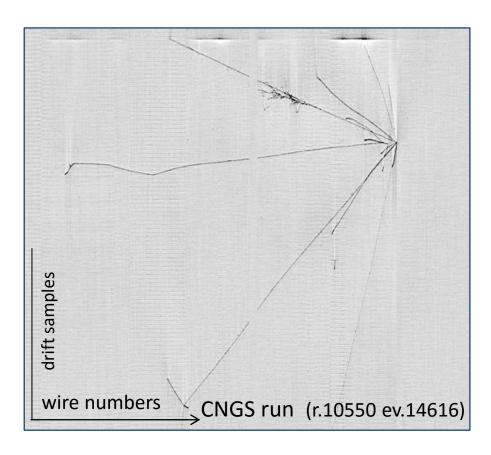
- distance between segment endpoints
- angle between segments

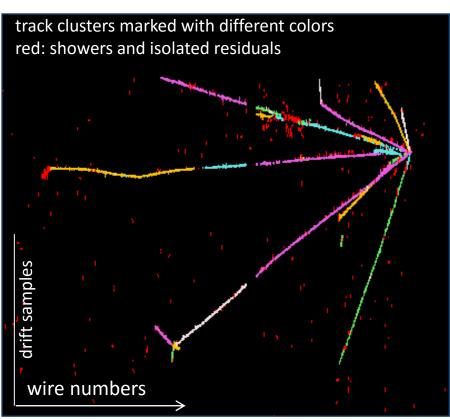


#### 3. Shower or track classification

Based on sizes and configuration of segments from step #2.

#### **Example of event segmentation output**





- 2D: the most direct information
- Shower-like, track-like clusters

hits, space points, cells, blobs

clusters: track like, shower like objects

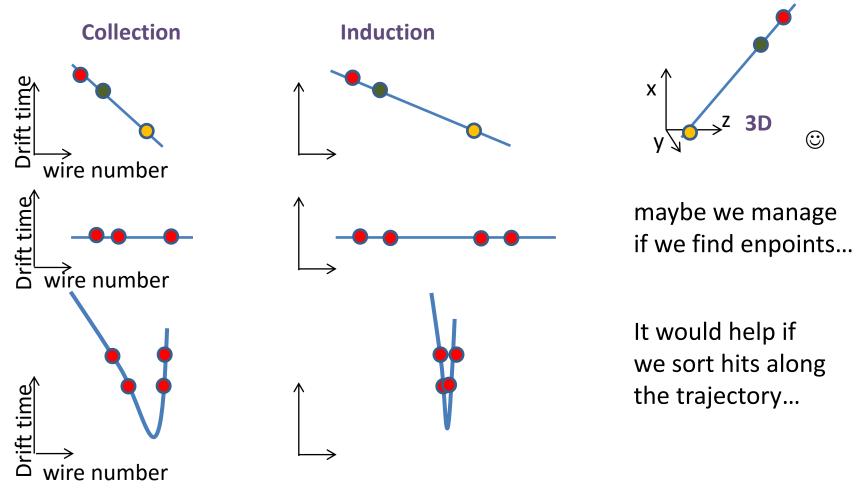
#### trajectory, vertices

- Use 3D space points from preceding stage: refit reduced information
- Or look at 2D data selected by clustering: fit directly to measurement

identification of particles and interactions

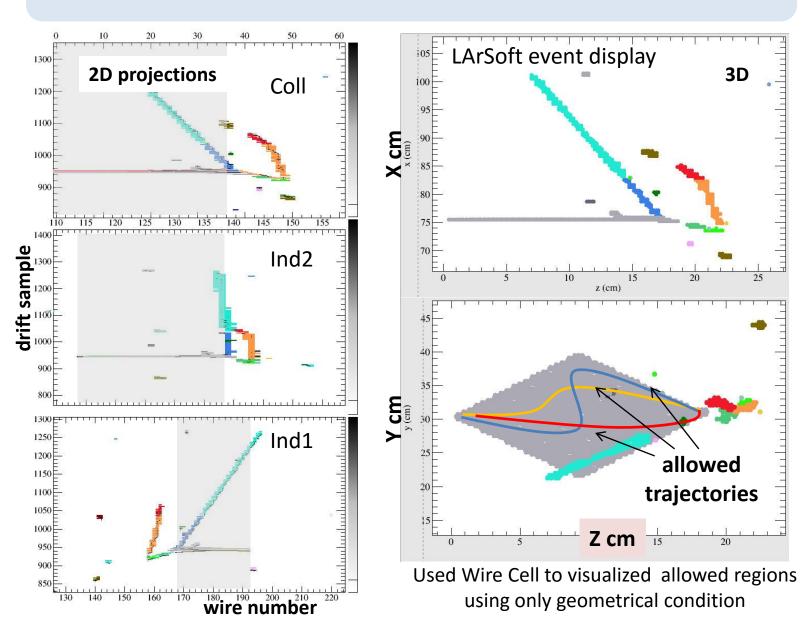
## 3D reconstruction – first attempts

RECIPE for 3D reconstruction: associate hits in different projections according to the electron drift time.

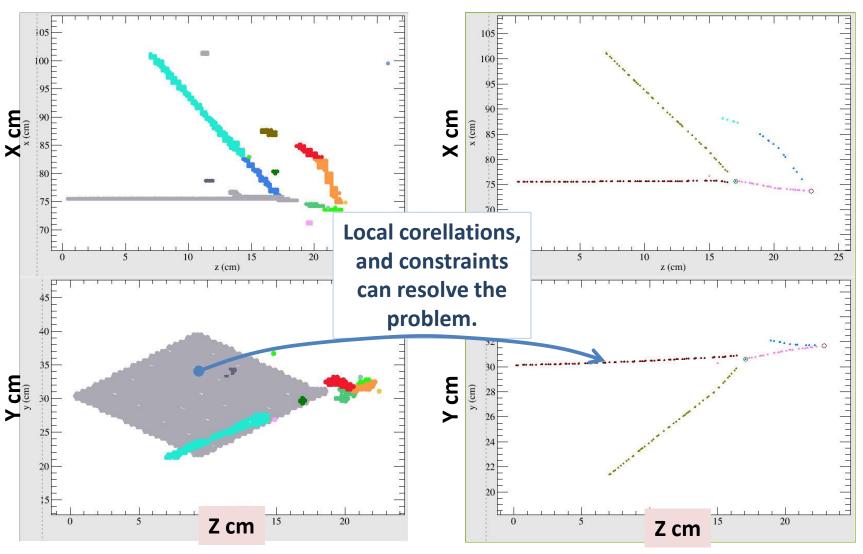


Development of more advanced methods was natural.

## Special case: wire plane parallel blindness



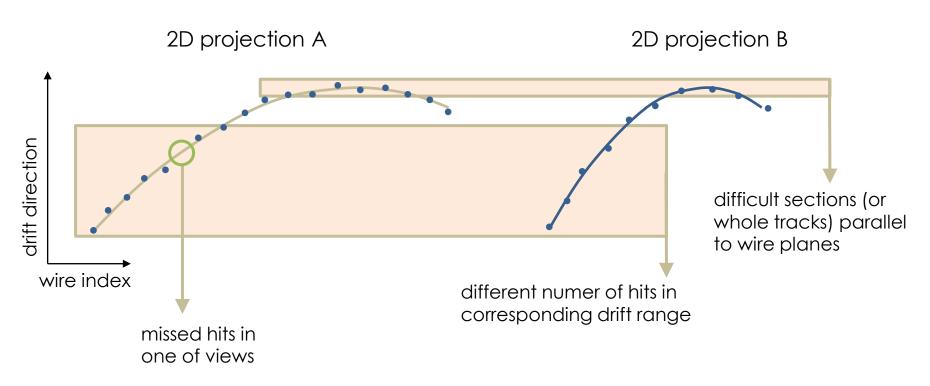
## Special case: wire plane parallel blindness



Wire Cell: geometrically *allowed regions* 

PMA trajectory fits

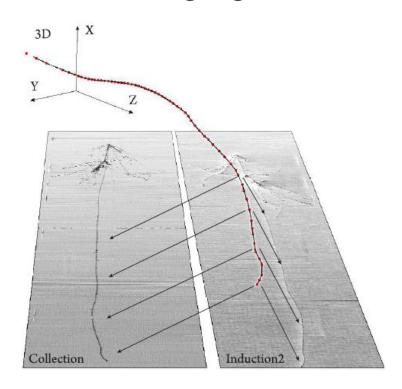
#### More on realistic conditions in reconstruction



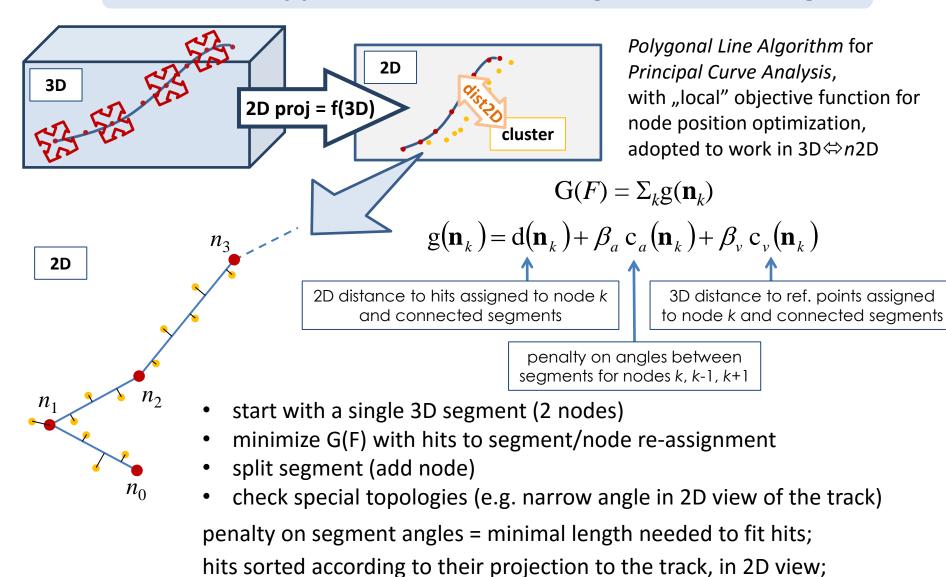
- hit positions are not perfect, 2D views are independent, corresponding track sections are made of different numbers of hits, ... ...
- > problematic search for (approximately) compatible hits between 2D projections, especially for tracks parallel to drift field and parallel to wire planes.
- work with independent 2D tracking, hit sorting along the trajectory, ... → satisfactory results in performance tests were not achieved.

#### **Trajectory reconstruction - Projection Matching Algorithm**

- Reconstruction chain: 3D steps depend on preceding stages.
- Recent developments of Projection Matching Algorithm:
  - Single track.
  - multi-track structures.
  - Initial part of the cascade.



#### New 3D approach: basics of a single track building



straight-forward calculation of dX seen by a hit, ...

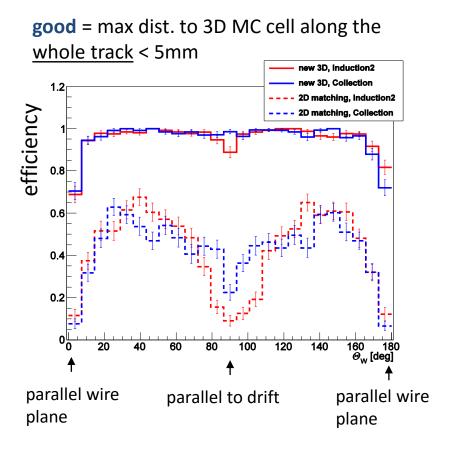
hit projection to 2D view of the track segment defines its 3D position;

24

#### PMA vs old approach

Efficiency was measured on 30 cm stopping muon tracks, ratio:

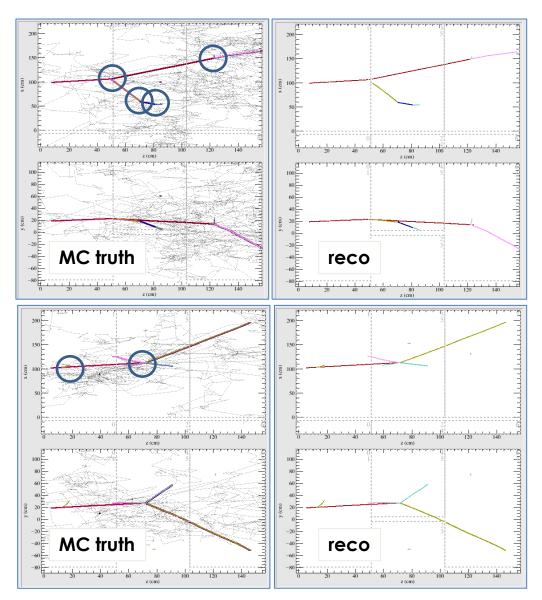
as a function of an angle of the *initial direction w.r.t.* the wires, with a **strict definition of a "good" track** to enchance the difference (note: many other eff. measures can be invented)



#### **Features of PMA**

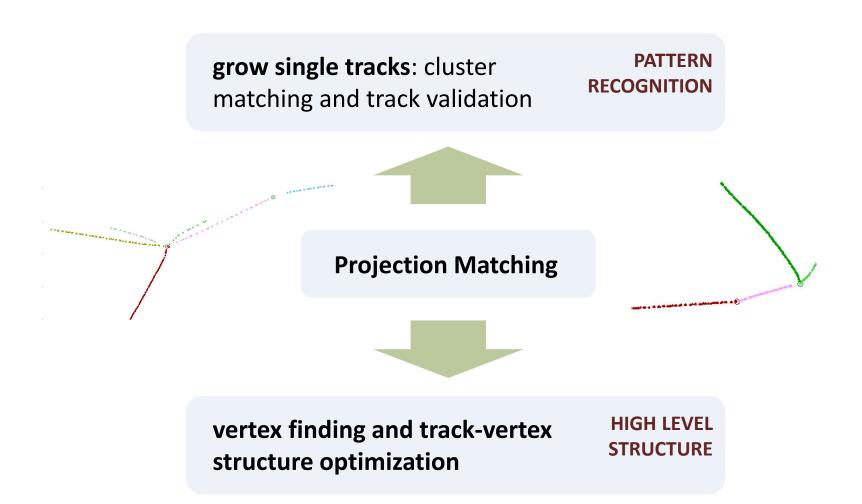
- <u>hit hit association is not needed</u>, each 2D hit has its own 3D position on the trajectory, it is *independent* from hits in other projections
  - reconstruction can use 2 or 3 views; even sections with only 1 view are still useful (in case of e.g. dificult track orientation, hit/cluster inefficiency, hardware problems, ...).
- full 3D objects are driven directly by 2D information; no intermediate step with 3D hits/points to be refitted again into tracks in 3D space.
- the optimization can take into account also 3D points: vertices, feature points, ..., if available from other algorithms.
- space charge can be easily accommodated in the 3D→2D projection function used during the optimization, as well as any other non-uniformities resulting in spatial distortions, if such mapping is available (however computational cost can increase).
- basic idea can be widely extended to many aspects of reconstruction next slides.

## Multi-track structure example ( $\pi$ - @ 2GeV)

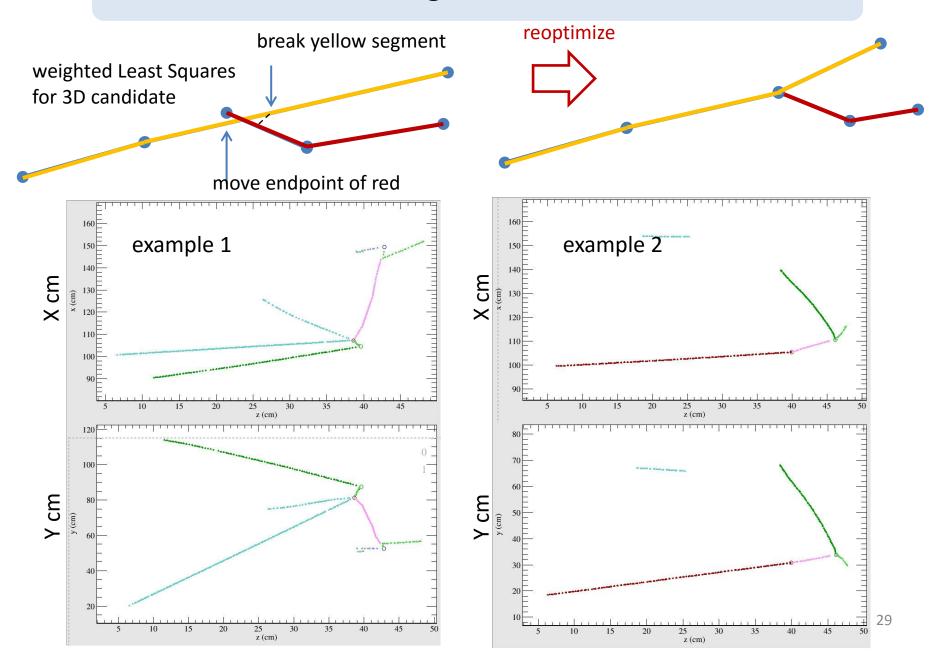


- multiplicity low enough for efficient track reconstruction.
- $\pi^0$ s multiplicity: 1-2 per event on average.
- need vertexes to understand relation between isolated tracks.

#### **Full PMA**

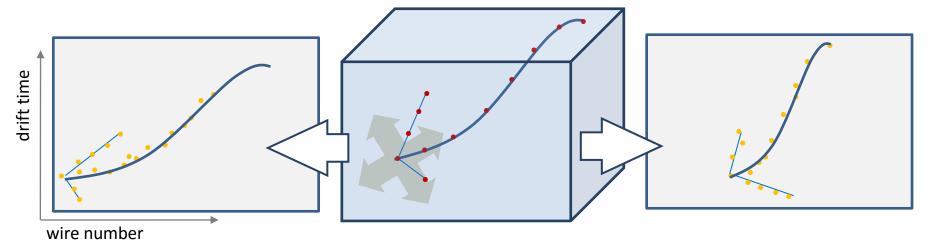


## Full PMA: meaningful structure of an event

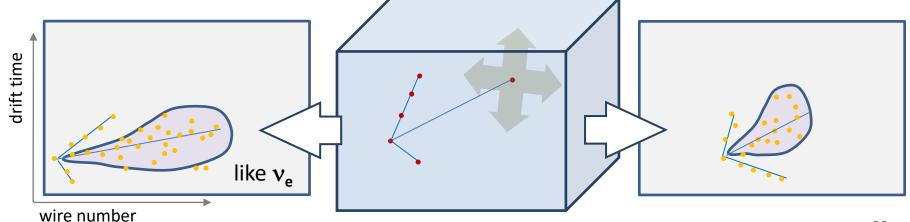


## Full PMA: tracks, vertices, also cascades

 mutli track structures → vertex position + track directions using full information available in the vertex region.

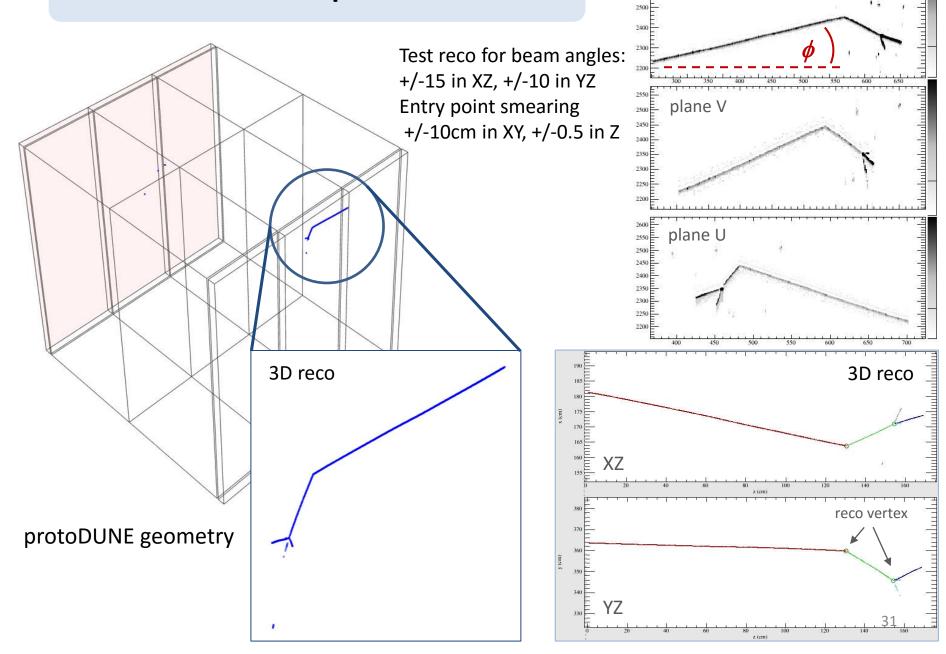


• EM cascade axis or its starting segment made from a few hits only.



30

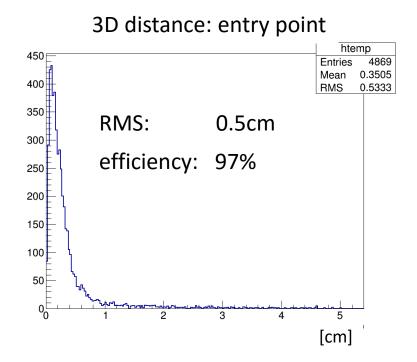
## **Test beam in protoDUNE**

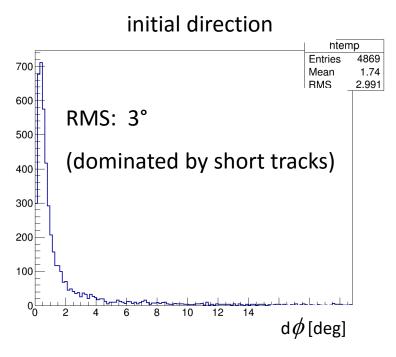


plane Z

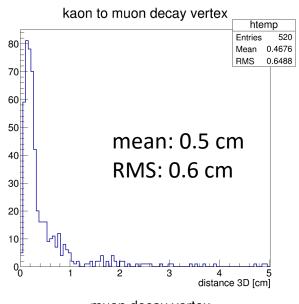
## **Clean track spatial reconstruction**

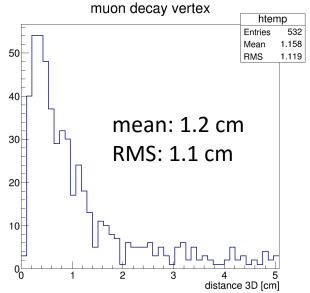
- $\pi^+$  beam at 2GeV simulated,
- plots: reconstruction quality of the incident particle,
- easy case: clean track,
- but includes short trajectories and many wire-plane parallel tracks.

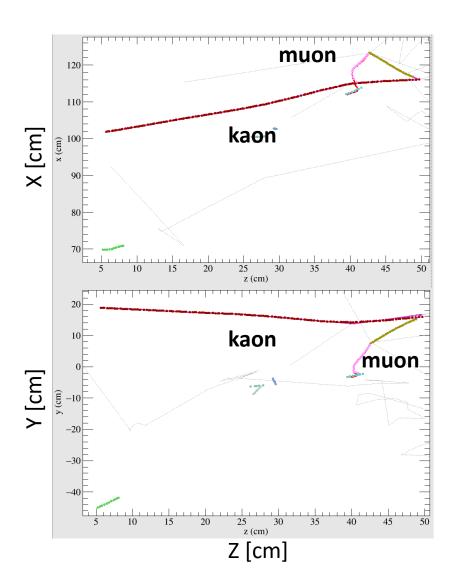




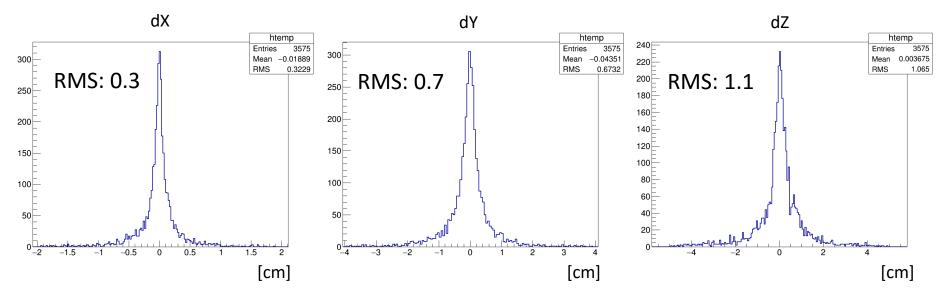
## Particle decay chain: $K \rightarrow \mu \rightarrow e$



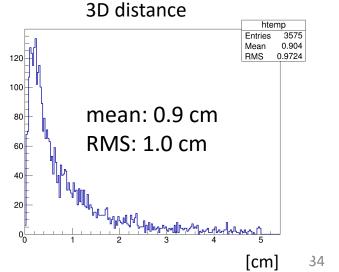




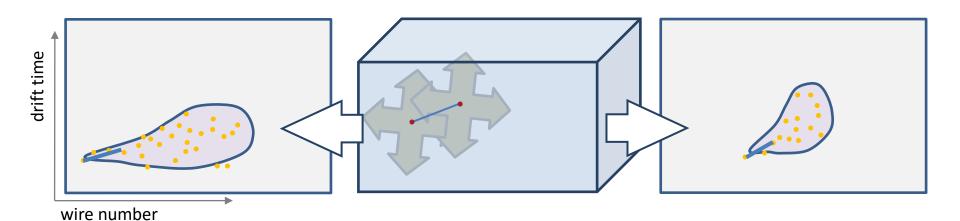
#### Secondary vertices of inelastic scatterings

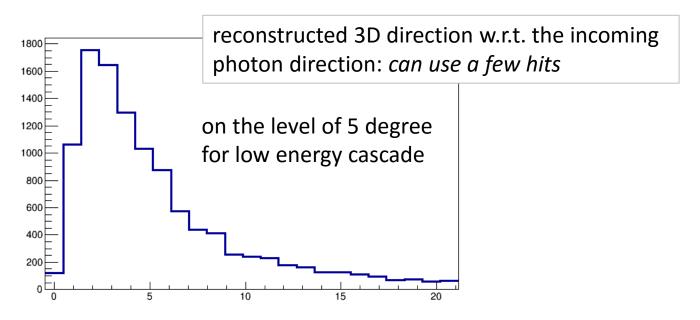


- Protons with initial momentum 2 GeV/c.
- Inelastic interaction vertex positions tested (realistic visibility citerion: min. 2 daughters > 50MeV kinetic energy).

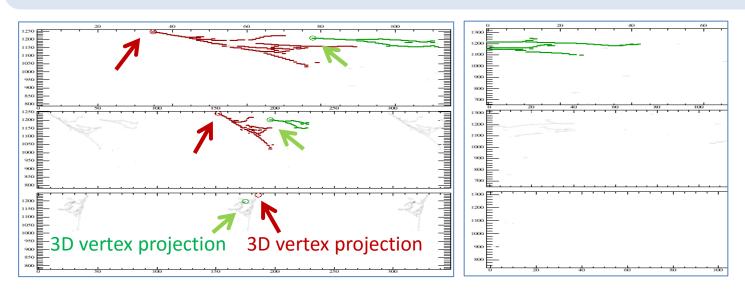


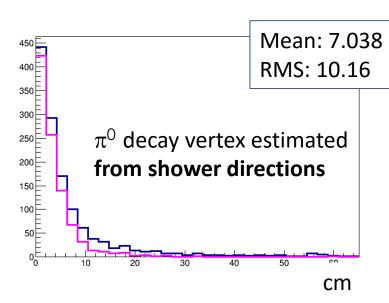
## **Initial segment of EM shower**

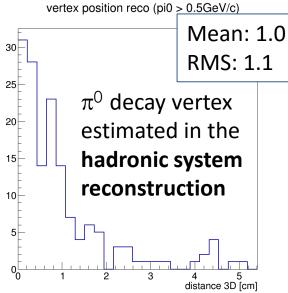




#### $\pi^0$ vertex reconstruction







Both methods to be used to find showers compatible with hadronic interaction vertex.

hits, space points, cells, blobs

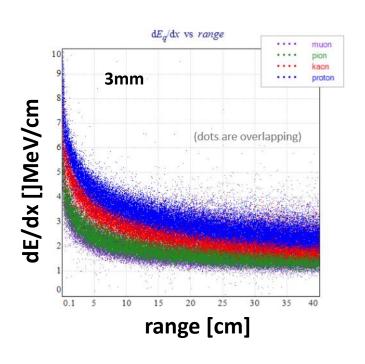
clusters: track like, shower like objects

## trajectory, vertices

- Use 3D space points from preceding stage: refit reduced information
- Or look at 2D data selected by clustering: fit directly to measurement

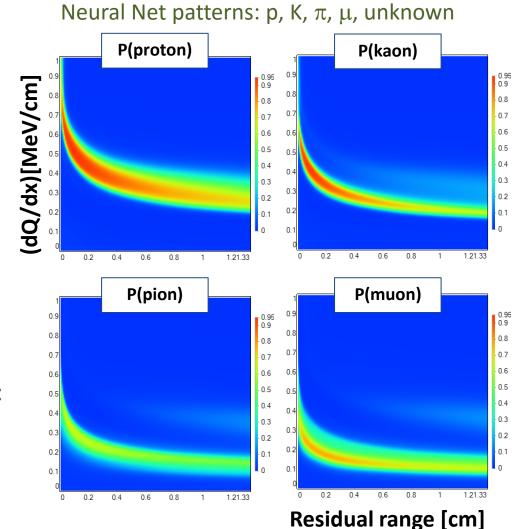
identification of particles and interactions

## Stopping particle identification by dE/dx



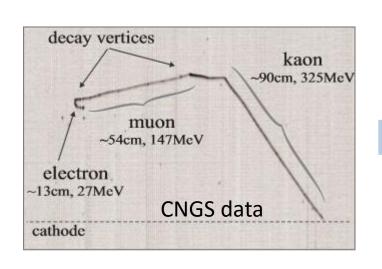
• dE/dx distribution at given range: not gaussian, not even symmetric, reconstruction artifacts, ...  $\rightarrow \chi^2$  not enough.

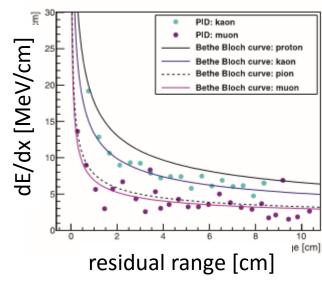
 neural network classification, with number of free params optimized.

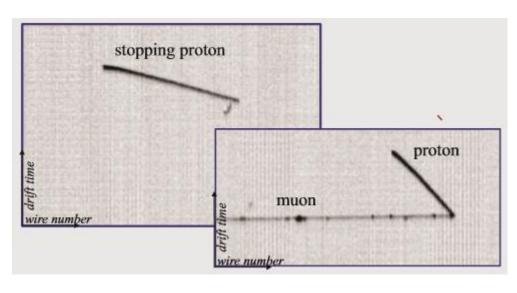


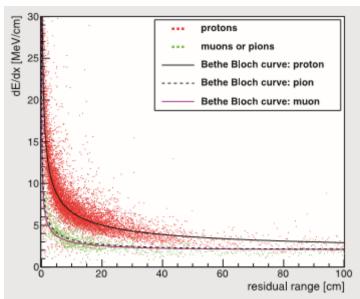
patterns -> P(stopping), P(particle ID)

# Stopping and decaying particles in ICARUS

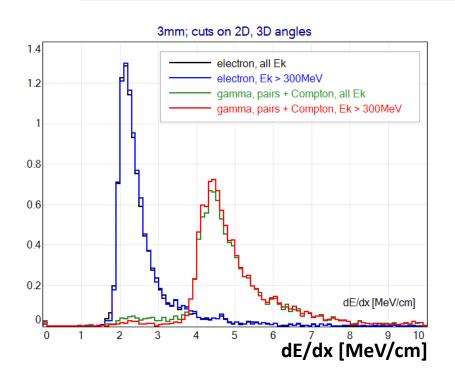


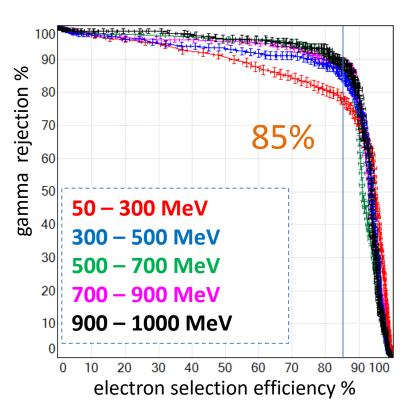






## Type of neutrino interaction: dE/dx ingredient





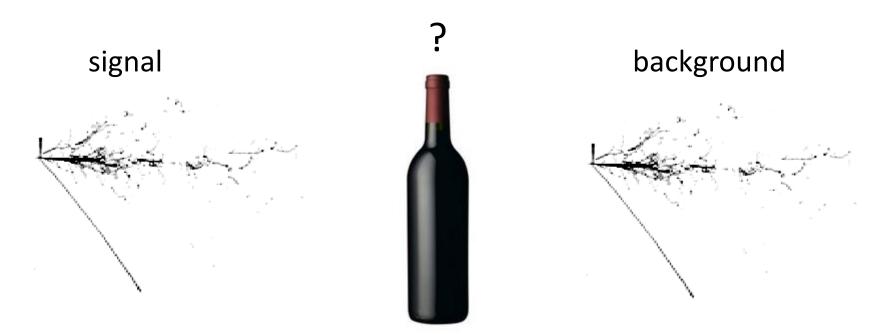




#### survey

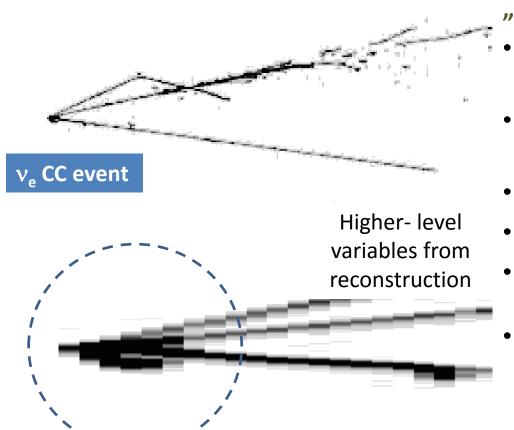
# http://goo.gl/forms/d2cqv6G64f

by Piotr Płoński



Contact: <a href="mailto:pplonski86@gmail.com">pplonski86@gmail.com</a>

# Type of neutrino interaction: topology and vertex region exploration



#### "Standard" reconstruction does a lot:

- Global features: energy deposition, cascade profiles, ...
- Features of cascade initial part to some extent.
- Spatial/calorimetric track details.
- Particle identification.
- Topology of points of interactions in the event.
- Algorithms on this level of details are being perfected.

PRIMARY VERTEX

Still: full information is not yet used.

Especially features of primary vertex are challenging, more advanced methods will come.

## Summary of neutrino ineraction analysis

**Physics needs:** neutrino flavor identification, neutrino energy.

Flavor: we know quite well how to do it

Topological recognition of

- Electron / gamma cascade.
- Long muon candidate: no inelastic scatterings at enough distance.

Topological/calorimetric reconstruction of

- dE/dx in electron / gamma cascade start.
- dE/dx for shorter muons identification: stopping muon (very hard, rather unlikely), identified Michel electron at the endpoint.

#### **Energy:**

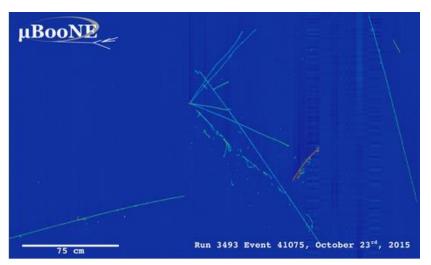
- Precise at low energies if simple topology and stopping particles.
- <u>Challenge</u>: quickly limited by uncertainties related to interacting particles: PID much harder, neutral particles, escaping etc.:
  - use test beams data, not only MC modeling projects are starting.
  - obtain calibration factors as a function of reconstructed quantities: observed energy, multiplicity of tracks, vertices, EM/hadron separation, many, many other quantities can be tested.

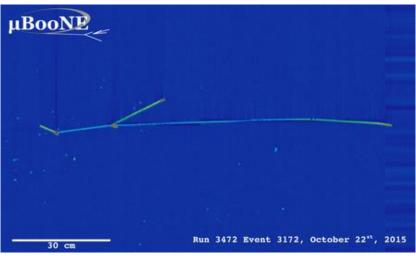
### Summary

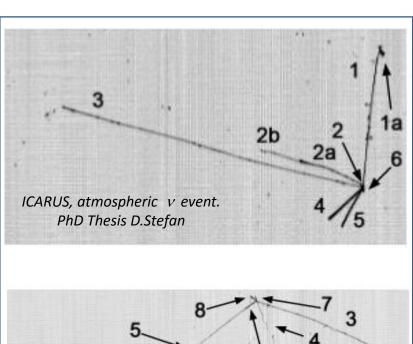
- Reconstruction in LArTPC: complexity of detector properties and detection technique.
- Presented reconstruction chain is one of main presently developed approaches. Similar stages can be identified in all of them, despite significantly different underlaying ideas.
- Several practical applications were presented. Complete reconstruction and analysis of neutrino event is still being developed, but many smaller physics tasks are achievable now.

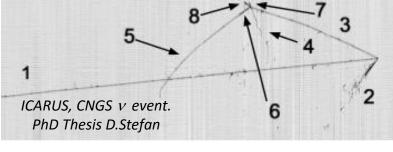
# **Backup**

## LAr TPC: resolution and details at different scales









#### **Conclusion**

#### Physics needs

- Neutrino flavor identification
- Energy of neutrino

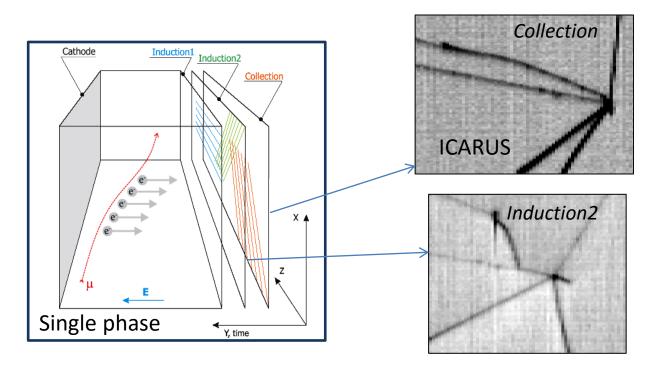
#### Flavor:

- Topological recognition of
  - Electron / gamma cascade
  - Long muon candidate: no inelastic scatterings at enough distance
  - ...
- Topological/calorimetric reconstruction of
  - dE/dx in electron / gamma cascade start
  - dE/dx for shorter muons identification: stopping muon (very hard, rather unlikely), identified Michel electron at the endpoint

#### Energy:

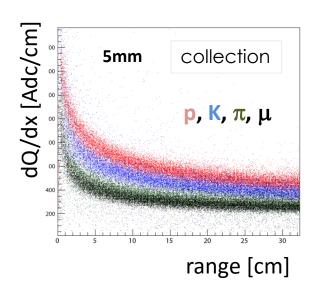
- Precise at low energies if simple topology and stopping particles.
- Quickly limited by uncertainties related to interacting particles: PID much harder, neutral particles, escaping ...
- Only estimation is possible: note that not much work is done in this direction!
  - Use test beams, not only MC modeling projects are starting
  - Obtain calibration factors as function of reconstructed features: observed energy, multiplicity of tracks, vertices, EM/hadron separation, many, many

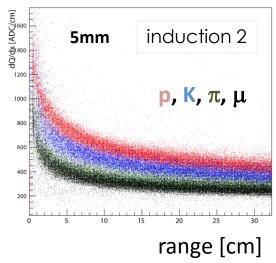
## **LArTPC** principles

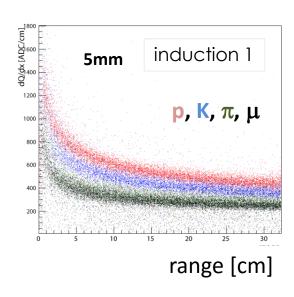


- Prompt scintillation light, light collection system gives the time reference (t<sub>0</sub>)
  and/or trigger signal
- e<sup>-</sup> from ionized track drifted in LAr by E field.
- Readout wires planes at different angles.
- ADC waveforms versus time read from wires form 2D projections of events.

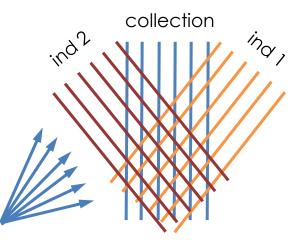
## Single track: stopping particle patterns







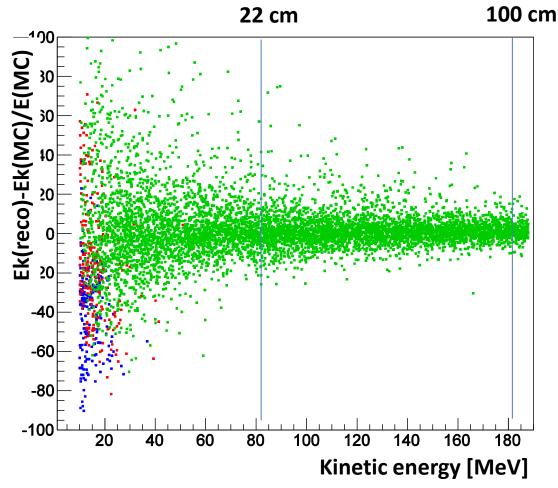
- here: ~5mm wire pith → narrow bands,
   but fewer data points along the track w.r.t.
   3mm.
- best (longest) projection can be selected.
- here: beam in cone most favorable for induction2 and most parallel to induction1 wires.



# Some examples of application

- electron/gamma seperation,
- simple topologies like in proton decay,
- $\pi^0$  reconstruction,
- angular recombination studies.

#### Muon calorimetric reconstruction



3D muon reconstruction, Birks formula was used to correct for the recomb. momentum reconstruction for muons with momentum < 1GeV/c:

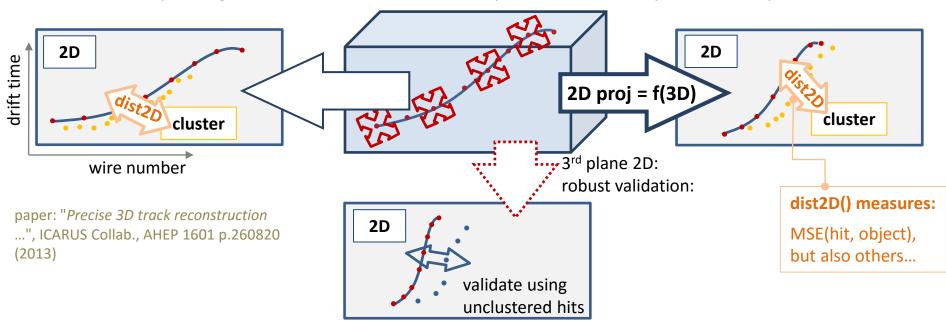
- use range
- use calo with exact recombination correction (Birks)

momentum reconstruction for muons with momentum > 1 GeV/c:

- in this range the energy deposition from clusters gives best estimate.
- Birks formula overestimates the momentum.

## New 3D approach: general concept

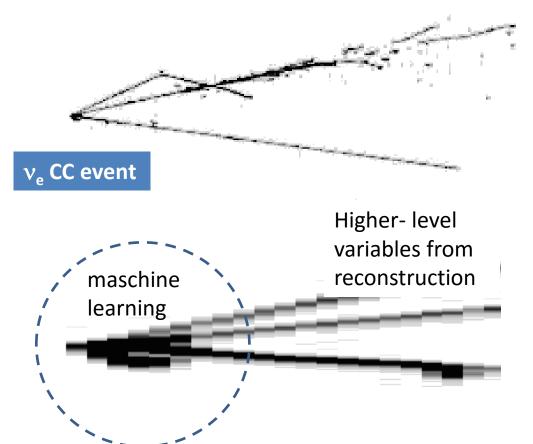
works in 3D (on **single track** or **full track structures**) to match the object's 2D projections to hits



### **Summary**

- Projected Matching Algorithm (PMA): initial work for ICARUS, now reimplemented in LArSoft, track-vertex structure fit developed.
- PMA can be used with any clusters, in LArSoft tested on Cluster Crawler (2D pattern recognition) and on Cluster3D (3D pattern recognition)...
- ...therefore it is natural to try PMA fit with Wire-Cell cluster.
- PMA had been tested on data: ICARUS, LArIAT, ArgoNeuT.
- Many many ideas for the future...

## From rough to detailed reconstruction



#### We can reconstruct a lot:

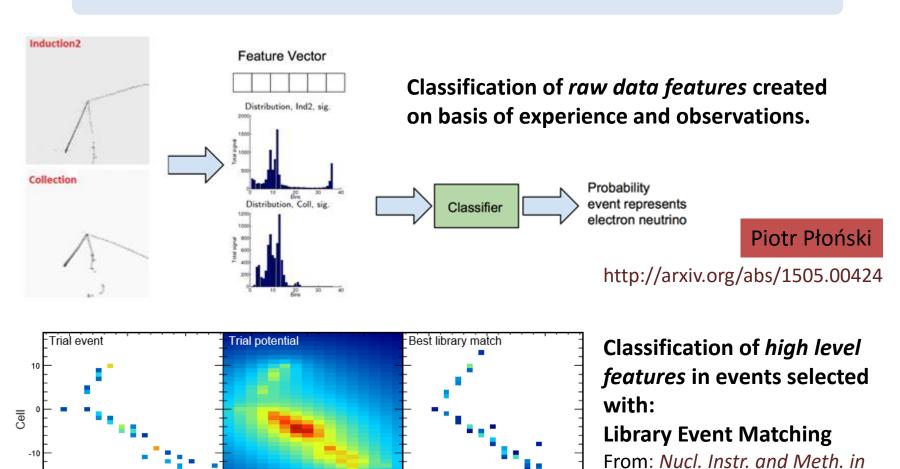
- Global features: energy deposition, profiles, ...
- Spatial/calorimetric track details.
- Particle identification.
- Topology of points of interactions in the event.
- ...
- Algorithms on this level of detail are being perfected

**PRIMARY VERTEX** 

Larsoft simulation

But still full information is not yet explored. Especially features of primary vertex are still challenging.

#### Future of event classification?



C. Backhouse, R. B. Patterson

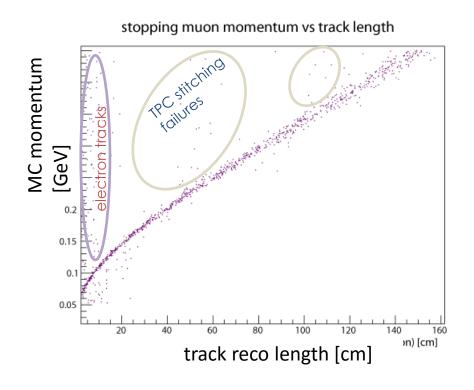
Physics Vol. 778 (2015)

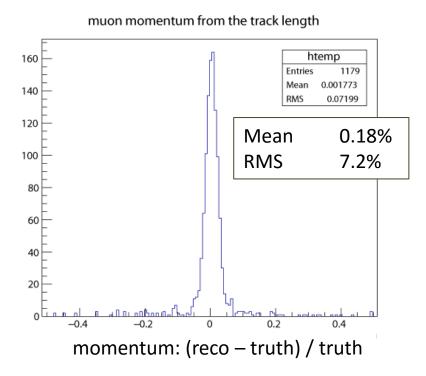
Or another technique capable of extracting discriminating features and/or building class models automatically, without human guidance.

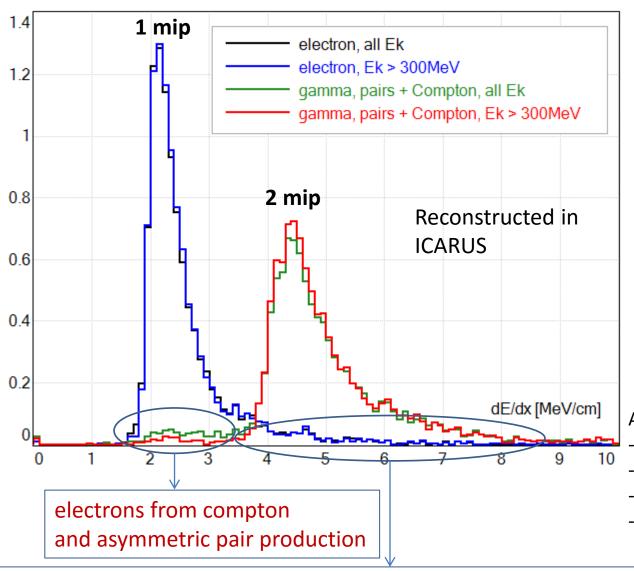
**NOVA** 

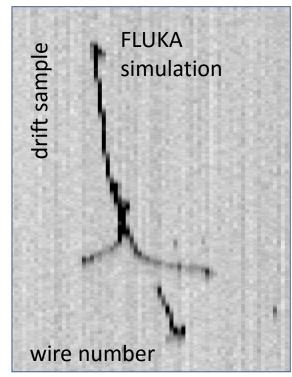
## Single track reconstruction

stopping muon momentum reconstruction is based on the track length: 50 - 450 MeV/c tracks simulated, varying angle w.r.t. the wires, crossing up to 3 TPC in 35t geometry.









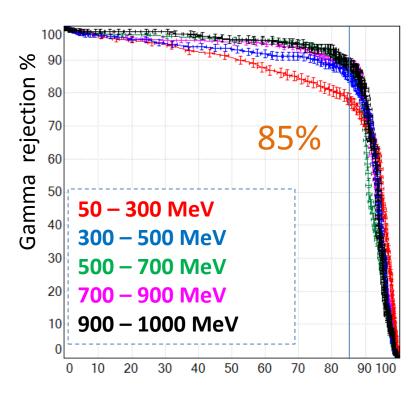
Asymmetric and open pairs:

- can mimic signal
- cut on energy in vertex
- try identify particle in vtx
- depends on spatial orientation

Difficult to reduce the number of events from the tail.

High dE/dx is due to the secondary tracks within the selected initial part of the shower.

# Electron selection efficiency vs gamma rejection Various momenta of incoming electron/photon



Electron selection efficiency %

#### Moreover:

- angular cuts can improve bkg rejection.
- realistic instead of isotropic cascade directions should be also better separable.
- preliminary results for higher momenta cascades seem to be better: can reach 90%/90% or higher.

# Summary: $v_e$ CC and $v_\mu$ CC

#### • ν<sub>e</sub>CC identification:

- Shower coming out from primary vertex.
- dE/dx of initial part of cascade corresponds to 1 m.i.p.
- Shower should be attached to the primary vertex have to be studied in the real situation of crowded vertex.

#### • $v_{\mu}$ CC identification:

- Muon coming out from primary vertex.
- Possibility of identification of stopping particle, however recognition.
   between pion and muon is very hard.
- Identification of muon based on the particle length.

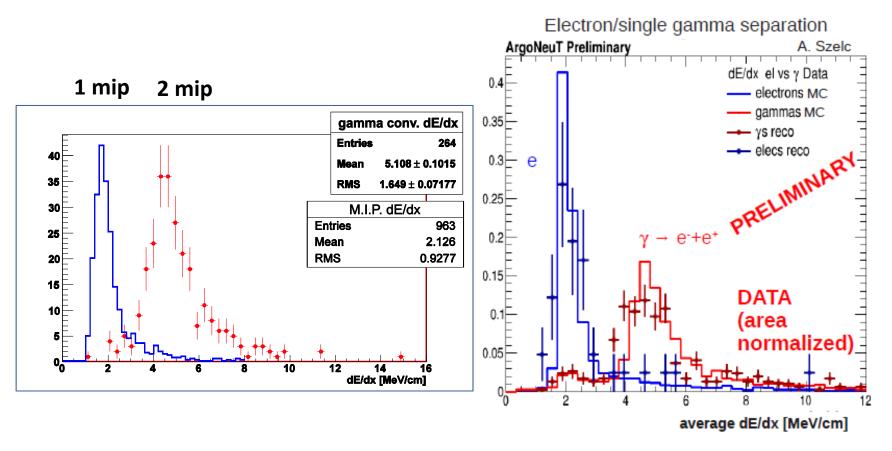
#### Reconstruction is progressing very well:

CERN, England, Poland, Spain, Switerland, USA....

- Single particles can be reconstructed automatically.
- Simple topologies without showers can be also reconstructed automatically.
- Usually many vertices in the event: one should develop the method of identifing primary vertex. The most important missing piece in order to start the real analysis! – then we can try to understand how all uncertentities from different measurements affect final measurement sensitivities.

# dE/dx measurement in data

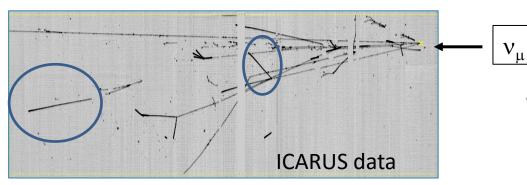
#### ~200 - 1000 MeV



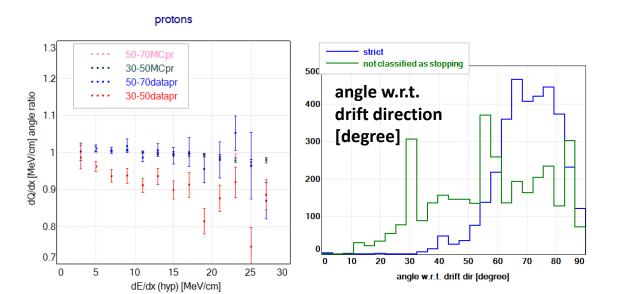
**ICARUS** data

ArgoNeuT data, A. Szelc (note: different properties of data sample, another processing algorithms, ...)

# Angular recombination studies with ICARUS data

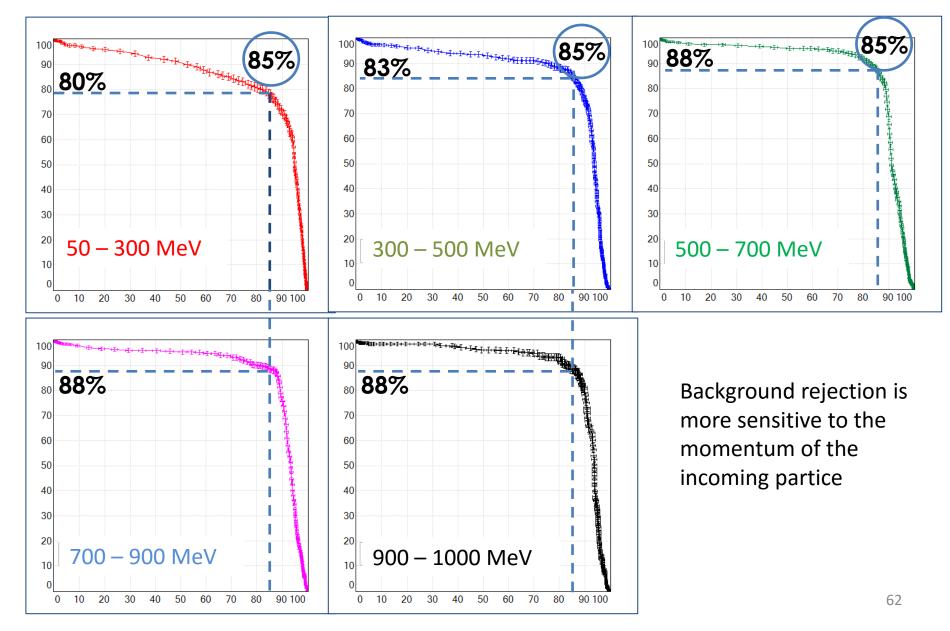


 work inspired by ArgoNeuT publication JINST 8 (2013) P08005.



- measurement of lower dQ/dx for tracks parallel to the drift direction w.r.t. to tracks parallel to the wire plane.
- very low statistics analysis to be repeated in protoDUNE

# Electron selection efficiency vs gamma rejection Various momenta of incoming electron/photon



## Studies of angular effects in recombination

#### **Calculation**

#### For each data point, on each track:

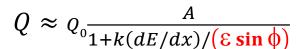
- 1. Take  $[dQ/dx; range; \phi]$  data point.
- 2. Take **dE/dx** from proton Bethe-Bloch curve corresponding to *range*.
- Put ratio dQ/dx / dE/dx in the histogram for each
   MeV/cm bins according to dE/dx, for one of φ
   bins:
  - 90° 70° (reference for the two below)
  - 70° 50°
  - 50° 30°

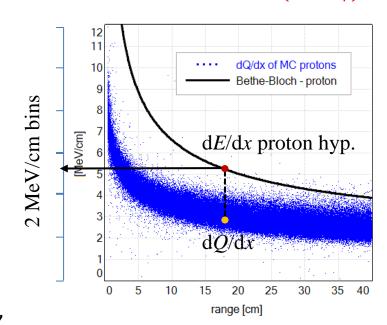
Calculate mean value for each dQ/dx / dE/dx ratio bin, for each  $\phi$  bin: reproduces recombination factor vs. hypothetical dE/dx at given angle w.r.t. drift direction.

- <dQ/dx / dE/dx> at 70° 50° and the reference <dQ/dx / dE/dx> at 90° 70°
- <dQ/dx / dE/dx> at 50° 30° and the reference <dQ/dx / dE/dx> at 90° 70°

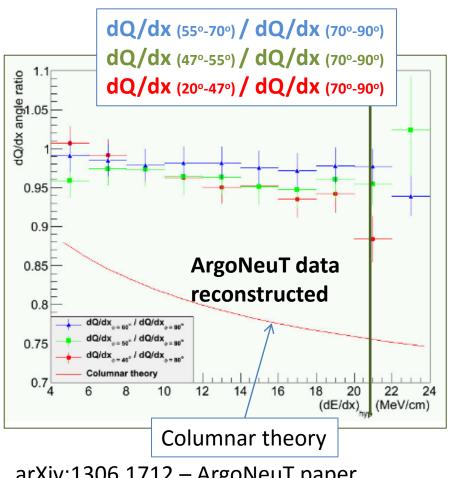
**Apply procedure to MC** (no angular dep. in recombination) to quantify systematics due to reconstruction.

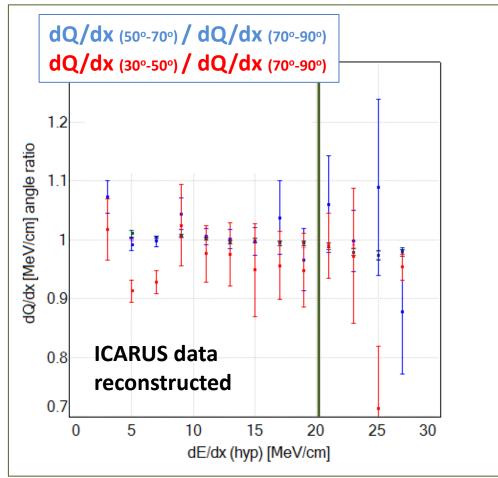
Apply procedure to data: is there any dependence or all the final ratios are flat at 1.0? 63





## **ArgoNeuT-ICARUS protons data comparison**





arXiv:1306.1712 – ArgoNeuT paper

#### Overall systematic errors of *final ratios* based on MC reconstruction:

(plots on next slides)

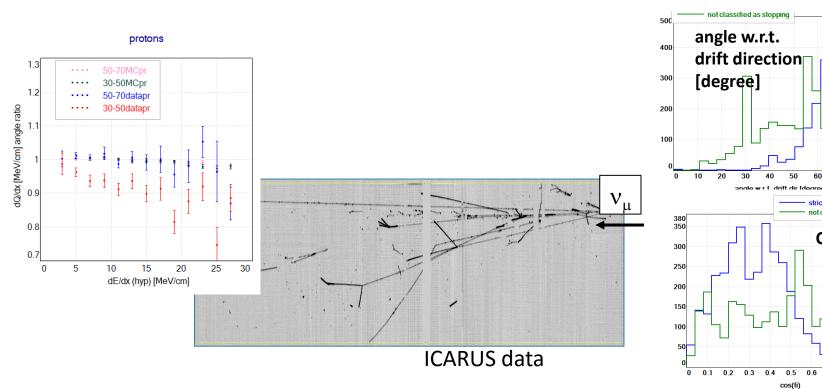
protons: 1.0 ± 0.01

pions: 1.0 ± 0.05

### **Angular recombination effect - comment**

Important: PID is selecting what looks like stopping proton with no angular effects, but:

- some protons interacting w/o visible secondaries;
- $\succ$  if stopping protons are attenuated due to  $\phi$ , they have similar dE/dx as the above;
- this is what we may consider important to investigate.



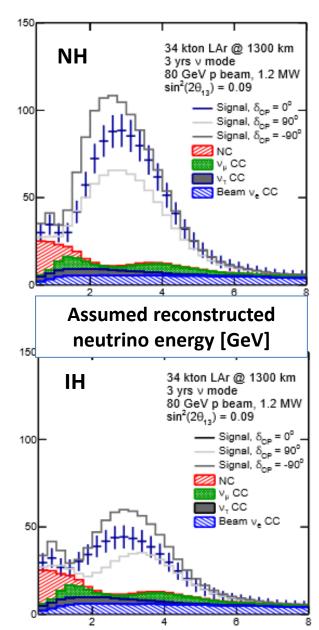
Cos

0.7 0.8

## **DUNE** experiment

- reconstruction is being automatized;
- reconstuction has impact on CP violation/MH sensitivities and data analysis.
- focus on  $v_{\mu} \rightarrow v_{e}$  and  $\overline{v}_{\mu} \rightarrow \overline{v}_{e}$

Plots from: The Long-Baseline Neutrino Experiment Exploring Fundamental Symmetries of the Universe arXiv: 1307.7335 [hep-ex] 22 April 2014



## **Neutrino event reconstruction and analysis**

## 1. 3D topology reconstruction AND calorimetry needed

ingredients

- Tracks
- Identify particles
- Interaction vertices
- Showers

primary vertex, particles hierarchy momentum reconstruction (transverse and total)

After we reconstruct the position of the primary vertex and outgoing particles:

## 2. Electron neutrino event – focus on shower

**spatial**: shower starting point (check if attached to pri vtx); shower direction. **calorimetry**: shower energy.

particle identification via dE/dx of the first part of cacade.

+ other particles which are coming out from primary vertex.

## 3. Muon neutrino event – focus on muon

**spatial**: initial direction and trajectory reconstruction for momentum estim. **calorimetry**: muon momentum.

particle identification absence of inelastic interactions; via dE/dx if stopping (efficiency can be low, depends on the detector calibration).

+ other particles which are coming out from primary vertex

full event

#### Non-uniformities in LArTPC

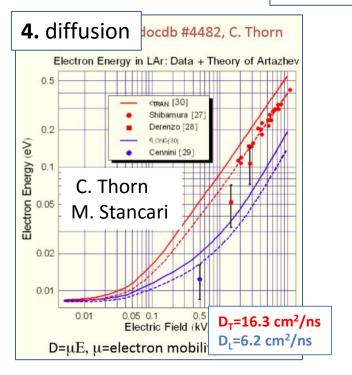
1. directiondependent resolution: wire spacing differs from signal readout

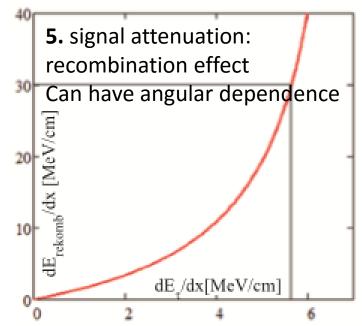
2. parallel to wire direction

3. wire plane parallel blindess

Wire Cell

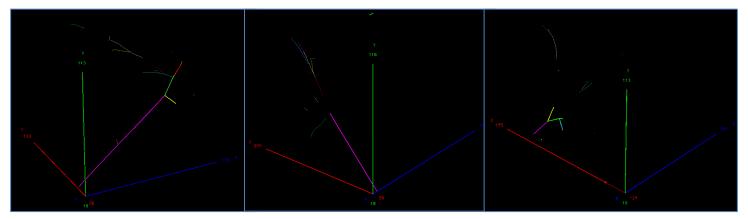
8. signal attenuation: purity





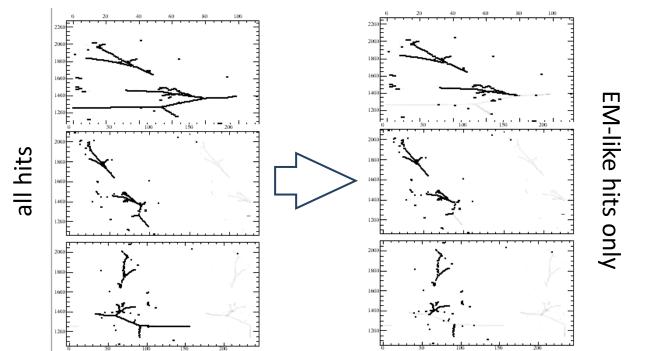
6. ... and space charge effect, ... and we have to be prepared for usual hardware failures.

# Multi-track structures: $\pi^-$ @ 2GeV: $\pi^0$ production, EM part separation



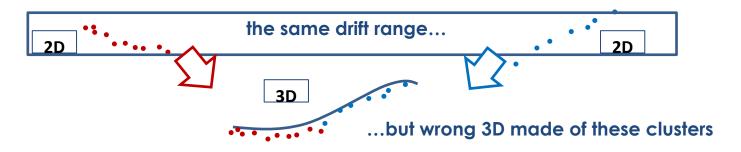
**solid:** MC truth hadrons overlapped with reconstructed tracks

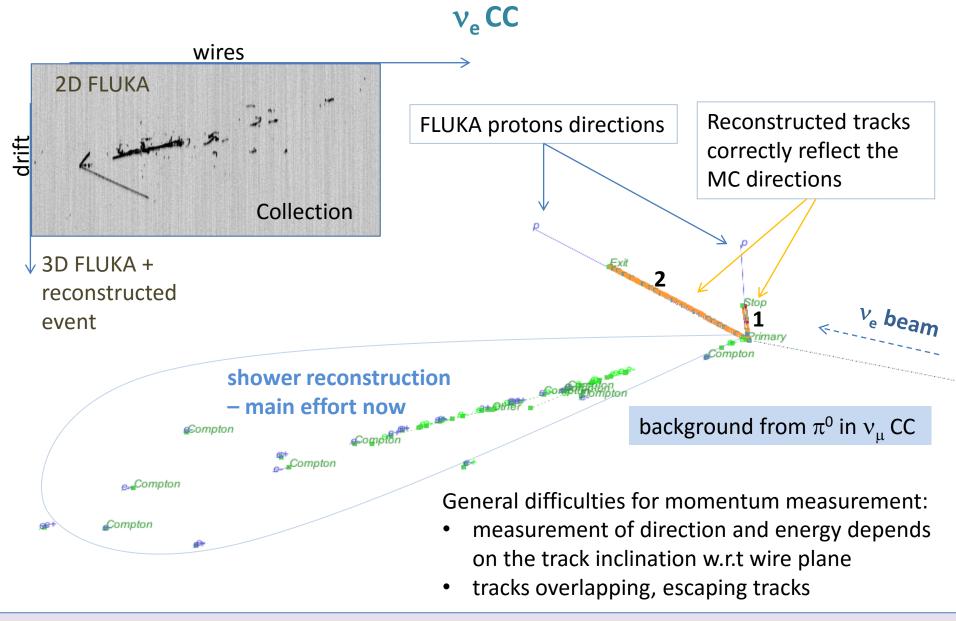
**dotted:** EM fragments reconstructed as tracks



## PMA practical implementation in LArSoft

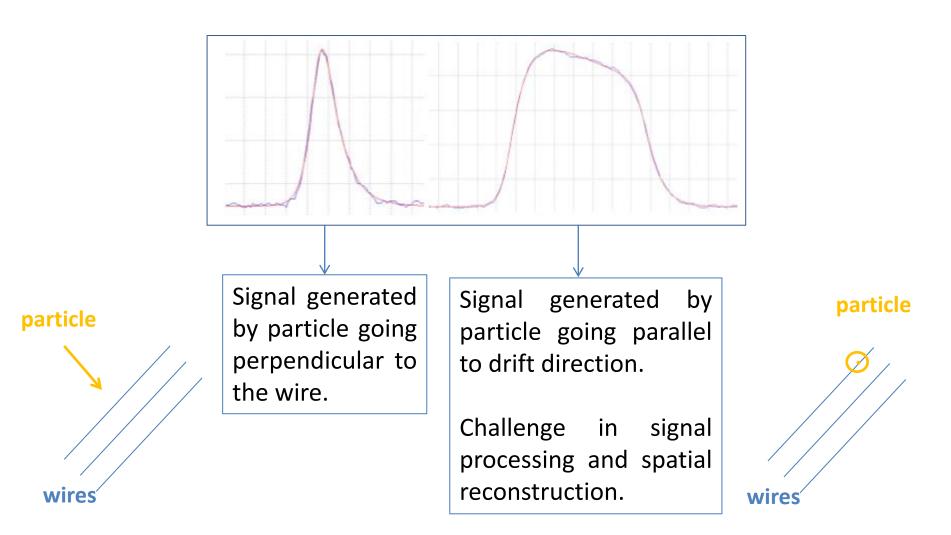
- efficient use of 2D clusters, can select best 2D views combination
  - start with the largest cluster (#hits)
    - use cluster most overlapped in drift time
    - make 3D track candidate
    - select best candidate (based on: validation in 3<sup>rd</sup> view; MSE; fraction covered by intertwined hits from 2 views)
    - grow the track by adding clusters (partially) matching the trajectory
      - while checkinng validation measures
    - finally, add matching clusters from the validation plane
  - loop for large / then for small starting clusters size
  - correct / merge / stitch / reoptimize ...
- quickly reject track candidate if 2D hits are not intertwined enough along 3D track: better behaviour in EM cascades and 2-plane geometry (thanks to Tingjun testing PMA on ArgoNeut data)





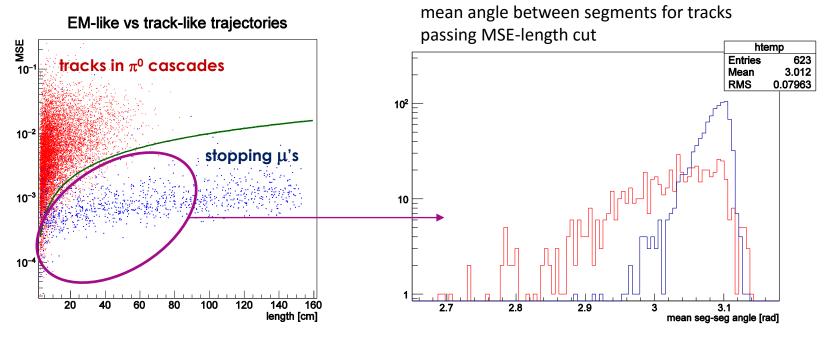
- 1 stopping particle: particle identification via dE/dx shows proton at 99.96% probability. Reconstrycted kinetic energy: 92 MeV +/- 8 MeV
- 2 particle exits the detector: 1mip not possible to make particle identification via dE/dx

# Tracks parallel to the drift direction



## **EM** part selection

- idea is quite a specific to PMA-based tracks, still would prefer to have it on the cluster level
- electron/EM-cascade-part versus hadron/muon track



- first trials, still testing, not good solution for large showers...
- global MSE / curvature measures are not completely enough, would like to try rough checks of dQ/dx
- may need to apply measures locally along the long track (as in large EM shower or track partially overlapped with EM cascade)
- subtract tracks and produce container of remaining EM-cascade-hits

# Protons @ 2 GeV/c – some plots

